

# A novel layered reconstruction framework for longitudinal segmented electromagnetic calorimeter\*

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In future high-energy physics experiments, the electromagnetic calorimeter (ECAL) will operate in exceptionally high-luminosity. An ECAL featuring layered readout in the longitudinal direction and precise time-stamped information offers a multi-dimensional view, enriching our comprehension of the showering process of electromagnetic particles in high-luminosity environments. And it is taken as the baseline design for several new experiments, including the planned upgrades of the current running experiments. Reconstructing and matching the multi-dimensional information across different layers poses new challenges in utilizing layered data effectively. This work introduces a novel layered reconstruction framework for the ECAL with a layered readout information structure and develops the layered clustering algorithm. It expands the concept of clusters from planes to multiple layers. Additionally, this work presents the corresponding layered cluster correction methods, investigates the transverse shower profile, which is utilized for overlapping clusters splitting, and develops the layered merged  $\pi^0$  reconstruction algorithm based on this framework. By incorporating energy and time information in 3-dimension, this framework provides a suitable software platform for the preliminary research of longitudinal segmented ECAL and new perspectives in physics analysis.

Furthermore, taking the PicoCal in LHCb Upgrade II as a concrete example, the performance of the framework has been preliminarily evaluated using single photons and  $\pi^0$  particles from the neutral  $B^0$  meson decay  $B^0 \rightarrow \pi^+ \pi^- \pi^0$  as benchmarks. The results demonstrate that compared to the unlayered framework, utilizing this framework for longitudinal segmented ECAL significantly enhances the position resolution and the ability to split overlapping clusters, thereby improving the reconstruction resolution and efficiency for photons and  $\pi^0$ s.

**Keywords:** Electromagnetic calorimeter. Layered reconstruction. Transverse shower profile. Merged  $\pi^0$  reconstruction.

## I. INTRODUCTION

1 Electromagnetic calorimeter (ECAL) is a detector used to  
2 measure the energy and momentum of high-energy electro-  
3 magnetic particles (e.g., electrons, photons, etc.). In particle  
4 physics, ECAL is able to measure the electromagnetic show-  
5 ering of particles within it and determines the energy and mo-  
6 mentum information of electromagnetic particles based on  
7 the energy deposition, providing important information for  
8 understanding the properties and interactions of elementary  
9 particles.

10 A high-performance ECAL is crucial for the precise detec-  
11 tion of high-energy physical phenomena and has been vali-  
12 dated in many experiments[1–4]. For instance, in the con-  
13 text of the LHCb experiment, during Run 1 and Run 2 of  
14 the Large Hadron Collider (LHC), approximately 33% of the  
15 decay products of heavy flavor particles are neutral particles,  
16 which decay to photons, such as  $\pi^0$ [5]. These photons exhibit  
17 a broad energy spectrum, ranging from a few GeV to several  
18 hundred GeV[6]. And thanks to the outstanding performance  
19 of the ECAL in LHCb[7, 8], the Run 1 and Run 2 experi-  
20 ments yielded a lot of impactful researches involving photons,  
21  $\pi^0$ s and electrons. The researches covered the exploration of  
22 photon polarization in the  $b \rightarrow s\gamma$  process[9], radiative  $B_s^0$   
23 decays[10], and other related studies. Additionally, the quan-  
24 tification of CP violation in decays such as  $B^+ \rightarrow K^+ \pi^0$   
25 decays[11] and  $D^0 \rightarrow \pi^+ \pi^- \pi^0$  decays[12] were conducted.

26 Furthermore, intriguing investigations into lepton universal-  
27 ity through the reconstruction of  $b \rightarrow s\ell^+ \ell^-$  transitions were  
28 performed[13][14]. The research also included rare decay  
29 searches, such as  $B_s^0 \rightarrow \mu^+ \mu^- \gamma$ [15], among others.

30 In the pursuit of new physics at the LHC, the high-  
31 luminosity LHC (HL-LHC) project has been proposed to en-  
32 hance the accumulation of collision data within a shorter  
33 timeframe [16–18]. Operating with an instantaneous lumi-  
34 nosity reaching  $10^{34} \text{ cm}^{-2} \text{s}^{-1}$ , the HL-LHC aims to amass  
35 an impressive integrated luminosity over its operational life-  
36 time [17, 19]. However, such high luminosity environment  
37 presents challenges such as increased detector occupancy,  
38 vertex pile-ups, and radiation resistance concerns. Many cur-  
39 rent detectors at the LHC are no longer adequate for oper-  
40 ation at HL-LHC condition, and also due to the long term  
41 radiation damage, necessitating urgent replacements. To en-  
42 sure optimal detector performance in high luminosity settings  
43 and facilitate new physics exploration, several experiments  
44 are planning detector upgrades [20–24].

45 The showering process of electromagnetic particles in an  
46 ECAL is influenced by factors such as particle type and in-  
47 cident energy, which, in turn, affect the distribution of de-  
48 posited energy [25]. An ECAL equipped with multiple read-  
49 out channels, spanning both transverse and longitudinal di-  
50 rections, facilitates the capture of time, energy, and other  
51 readout data in dual dimensions. This capability significantly  
52 enhances our comprehensive understanding of the physical  
53 processes within the ECAL across multiple dimensions, ul-  
54 timately leading to improved accuracy in reconstructing the  
55 energy and momentum of particles. Therefore, the longitudi-  
56 nal segmented ECAL has been taken as a baseline design in  
57 upgrades for many experiments.

58 The development of event reconstruction algorithms that

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60 fully exploit the energy, position, and time information acquired from the longitudinally segmented ECAL will enhance 61 the precision of energy-momentum reconstruction, cluster 62 splitting, and particle identification, thereby facilitating the 63 achievement of defined physical objectives. However, this 64 also introduces new challenges in how to reconstruct, match, 65 and efficiently utilize the longitudinal layer information. To 66 leverage the advantages of layered readouts, in forthcoming 67 high-energy physics experiments such as CMS, ALICE, etc. 68 [26–29], diverse software frameworks and reconstruction al- 69 gorithms have been devised and customized to effectively uti- 70 lize and store layered information.

72 Building upon the aforementioned background, this work 73 presents a comprehensive software framework tailored for a 74 longitudinally segmented ECAL, along with the development 75 of a layered clustering algorithm and cluster correction work- 76 flow. The layered reconstruction framework outlined in this 77 research merges data from the all layers to pinpoint potential 78  $Cluster^{3D}$  candidates. Subsequently, a seed will be identi- 79 fied in each layer from the readout cells of these  $Cluster^{3D}$  80 candidates. Utilizing these seeds as focal points,  $Cluster^{2D}$ s 81 in the all readout layers will be reconstructed (The definitions 82 of  $Cluster^{3D}$  and  $Cluster^{2D}$  will be elaborated in the subse- 83 quent sections). Finally, the performance is compared with an 84 unlayered reconstruction algorithm that simply combines the 85 information from corresponding readout units in each layer, 86 based on single-photon resolution, as well as the reconstruc- 87 tion resolution and efficiency for  $\pi^0$  from  $B^0 \rightarrow \pi^+\pi^-\pi^0$ . 88 The comparison leverages the 2023 baseline setup of ECAL 89 in LHCb Upgrade II (PicoCal)[30, 31].

## 90 II. SOFTWARE FRAMEWORK AND DATA STRUCTURES

91 The layered reconstruction framework is shown in the 92 Fig. 1. Modelling of the detector geometry is the cornerstone 93 of the framework. In order to adapt as many longitudinally 94 segmented ECAL structures as possible, the following data 95 structures are constructed to describe and carry the geometri- 96 cal information of the ECAL in this framework.

97 **Calorimeter:** It represents the ECAL and also stores the ab- 98 solute coordinates and size of the entire ECAL in space.

99 **Region:** It is a virtual geometry containing a series of **mod- 100 ules** with identical detector structure, material, and in- 101 stallation angle. And it is used to store the calibra- 102 tion and cluster correction parameters for this series of 103 **modules**.

104 **Module:** It represents the minimum installation unit and 105 stores the absolute coordinates, size and installation an- 106 gle of itself.

107 **Layer:** It is the key geometric data structure in this frame- 108 work, and physically represents a longitudinal segment 109 of the **module**. It stores all **Cell<sup>2D</sup>**s that are located at a 110 segmented readout layer in a **module**.

111 **Cell<sup>2D</sup>:** It represents the minimum readout channels in mod- 112 ules and contains information about the mounting po- 113 sition of the readout cell, the readout signal, and the 114 readout time-stamp.

115 Based on the aforementioned basic geometry structure, 116 the following cluster data structures containing two or more 117  $Cell^{2D}$ s are constructed and corresponding to the cluster 118 layer in the software framework. And the specific construc- 119 tion method of the following data structures will be intro- 120 duced in Sec. III A.

121 **Cell<sup>3D</sup>:** It consists of multiple  $Cell^{2D}$ s in the longitudinal 122 direction.

123 **Cluster<sup>2D</sup>:** It consists of multiple  $Cell^{2D}$ s at the same 124 layer.

125 **Cluster<sup>3D</sup>:** It consists of a  $Cluster^{2D}$  and multiple 126  $Cell^{2D}$ s in each layer and would be considered as a 127 candidate for photons, electrons, or merged  $\pi^0$ s.

## 128 III. RECONSTRUCTION

129 Based on the layered reconstruction framework, this 130 section will detail the reconstruction algorithm of the 131  $Cluster^{3D}$ , which serve as the candidates for electromag- 132 netic particles ( $\gamma/e$ ). And it will also discuss the method- 133 ology for reconstructing a merged  $\pi^0$  by splitting a single 134  $Cluster^{3D}$ . Additionally, it will outline the process for cor- 135 recting various parameters of the  $Cluster^{3D}$ , including en- 136 ergy, position, and time.

### 137 A. Layered clustering

138 The algorithm outlined in this section will detail the 139 methodology to finalize the construction of  $Cluster^{3D}$ s and 140 providing particle reconstruction information at each readout 141 layer in the form of  $Cluster^{2D}$ s. The flowchart of the lay- 142 ered clustering algorithm is shown in Fig. 2d. Firstly, the al- 143 gorithm search for  $Seed^{3D}$ s on a single layer, which includes 144 the realistic readout layer with smaller transverse showering 145 width, as well as a virtual single-layer calorimeter constructed 146 by merging information from all readout layers and construct 147 temporary  $Cluster^{3D}$ s in the virtual single-layer calorimeter 148 from  $Seed^{3D}$ s. This approach is motivated by two primary 149 considerations.

150 The first and most important point is that construct- 151 ing  $Cluster^{2D}$  in each layer and performing layer-by-layer 152 matching will consume a significant amount of computational 153 time. First, performing 2-dimension clustering in single layer 154 will ensure efficient online triggering.

155 Secondly, in layers with narrower transverse cluster devel- 156 opment, there is a chance to discover more non-overlapping 157 clusters, but at the same time, due to the narrower transverse 158 cluster development, there is less energy deposition. Because

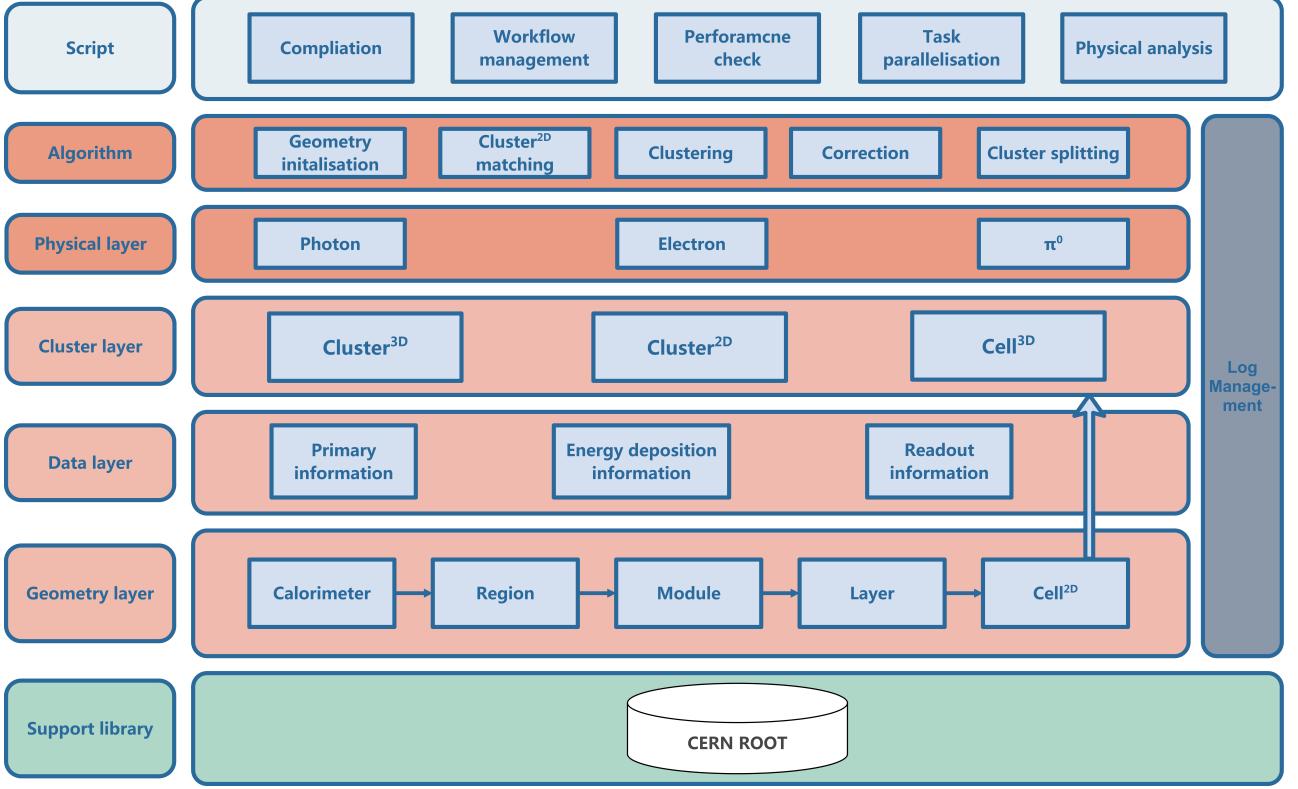


Fig. 1. Software framework.

159 of sampling fluctuations, some particles may not form effective seeds in this layer. Therefore, searching for  $Seed^{3D}$ s  
 160 from both  $Cell^{3D}$ s and  $Cell^{2D}$ s in layers with narrower cluster  
 161 development will help us achieve a balance in cluster separation and reconstruction efficiency.

162 Subsequently, based on the temporary  $Cluster^{3D}$ s, construct  $Cluster^{2D}$ s located on different layers to obtain the final  $Cluster^{3D}$ s. The integration of information from the different layers is initially performed by constructing a  $Cell^{3D}$ .  
 163 Details about each step of the layered clustering algorithm  
 164 will be elaborated in the following:

### 170 1. Constructing $Cell^{3D}$

171 To integrate the information in each readout layer, the  
 172 information from the corresponding  $Cell^{2D}$ s on both layers is utilized to establish a novel data structure known as  
 173  $Cell^{3D}$ . Specifically, the  $Cell^{3D}$ s are systematically constructed across the transverse section of the ECAL with a radius size equivalent to the module's Molière radius. Along  
 174 the longitudinal direction of the ECAL, all  $Cell^{2D}$ s falling  
 175 within the transverse span of a  $Cell^{3D}$  are amalgamated into  
 176 this  $Cell^{3D}$ , with each  $Cell^{2D}$  being included only once. The  
 177 energy of the  $Cell^{3D}$  is determined by the cumulative energies of the  $Cell^{2D}$ s it encompasses, and the position of the  
 178  $Cell^{3D}$  is defined as its geometric centre.

### 183 2. Searching $Seed^{3D}$ and constructing temporary $Cluster^{3D}$

184 When an electromagnetic particle strikes the ECAL, it will  
 185 radiate energy outward from the impact point, typically resulting  
 186 in the formation of the  $Cell^{2D}$  and  $Cell^{3D}$  with the highest local energy deposition near the impact point. Therefore, as depicted in Fig. 2a, the initial step in clustering is to  
 187 iterate through all  $Cell^{3D}$ s and  $Cell^{2D}$ s in specific layers to  
 188 identify the  $Cell^{3D}$  and  $Cell^{2D}$  exhibiting the highest local  
 189 energy deposition. For the local maximum  $Cell^{2D}$ , the corresponding  $Cell^{3D}$  will be considered as a  $Seed^{3D}$ . At the  
 190 same time, the local maximum  $Cell^{3D}$  will also be considered as a  $Seed^{3D}$ . The  $seed$  indicates that it serves as the  
 191 initial of the clustering process.

192 To prevent the faker  $Seed^{3D}$ s during the seeding process,  
 193 all identified  $Seed^{3D}$  must satisfy a transverse momentum  
 194 cut, typically defined to be greater than 50 MeV in this frame-  
 195 work. The threshold value of this cut can be lowered if required for investigating phenomena related to soft photons or  
 196 electrons. All the  $Seed^{3D}$ s passing the cut are labelled as the  
 197 final  $Seed^{3D}$ s and stored.

198 As a result of the transverse particle showering, the energy  
 199 is not fully contained within  $Seed^{3D}$ . Hence, it is imperative  
 200 to encompass a specific range of  $Cell^{3D}$ s around  $Seed^{3D}$   
 201 to guarantee optimal coverage of all energy deposits from  
 202 the particles. In this work, we will follow the method de-  
 203 scribed in Ref. [32] which uses a window of fixed size to  
 204 incorporate  $Cell^{3D}$ s. The specific procedure is as follows:

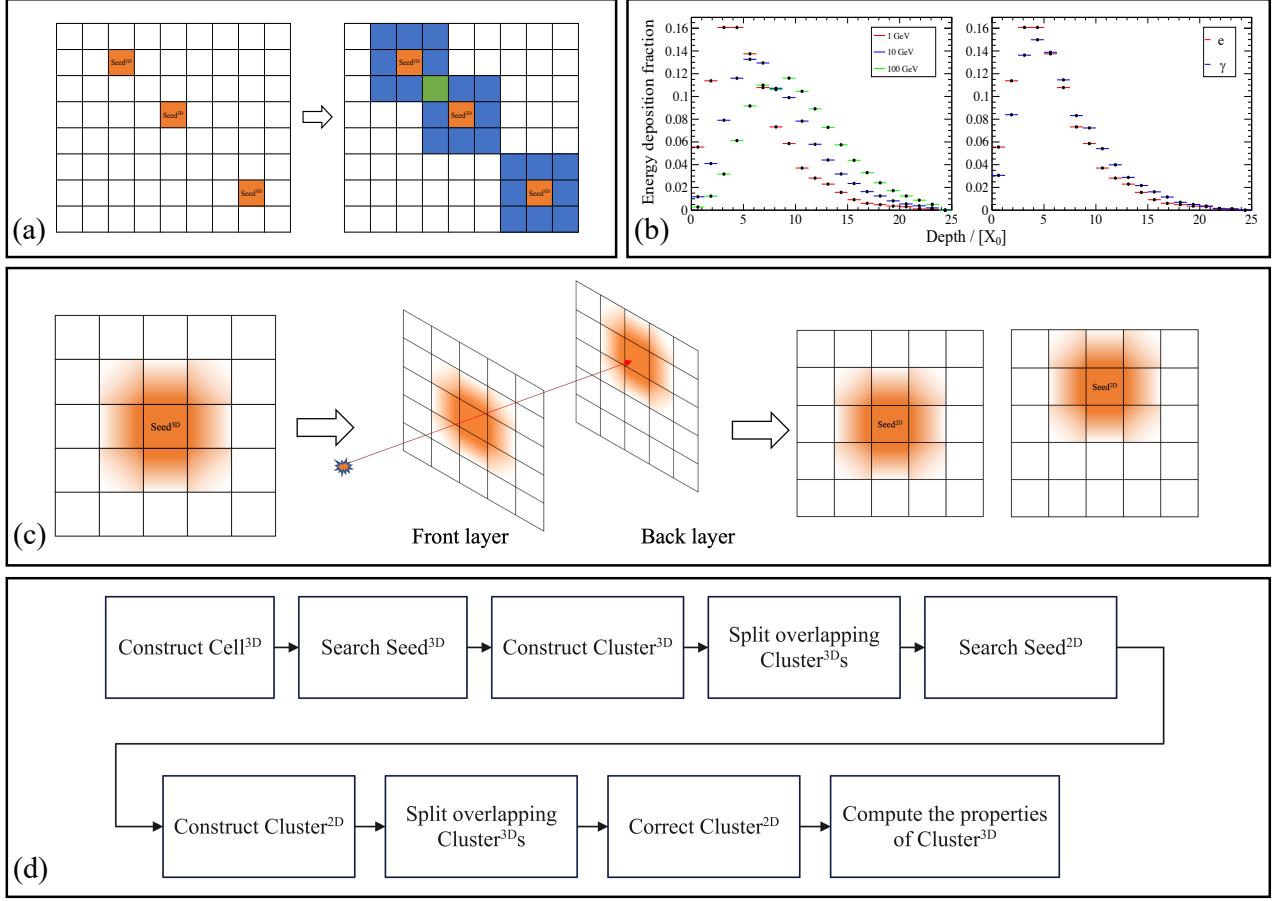


Fig. 2. (a): Searching  $Seed^{3D}$ s and constructing temporary  $Cluster^{3D}$ s centred on  $Seed^{3D}$ s, where the orange boxes represent  $Seed^{3D}$ s, the blue boxes represent  $Cell^{3D}$ s, and the green box represents  $Cell^{3D}$  shared by two  $Cluster^{3D}$ s. (b): The energy deposition in the longitudinal direction of ECAL, where the left plot shows electrons with different energies and the right plot shows the electron and photon with 1 GeV energy. (c): Searching  $Seed^{2D}$  in the  $Cell^{2D}$  of the temporary  $Cluster^{3D}$  and constructing new  $Cluster^{2D}$  in each layer. (d): Work flow chart for layered reconstruction.

210 centred around the  $Seed^{3D}$ s, the  $Cluster^{3D}$ s are formed by  
 211 incorporating all  $Cell^{3D}$ s within a  $3 \times 3$  window around the  
 212  $Seed^{3D}$ s, as illustrated in Fig. 2a. Additionally, the  $Cell^{2D}$ s  
 213 from all layers encompassed by the  $Cell^{3D}$ s are also included  
 214 as member of the  $Cluster^{3D}$ s. However, when the  $Seed^{3D}$   
 215 is located at the boundary of region, a special treatment is  
 216 required due to the different types of  $Cell^{3D}$ s in different re-  
 217 gions. Around the  $Seed^{3D}$ , within a radius of 1.5 times the  
 218 size of the  $Seed^{3D}$ ,  $Cell^{3D}$ s belonging to other regions will  
 219 also be included. In this paper a more detailed process is not  
 220 described. The above process may lead to the  $Cluster^{3D}$  at  
 221 the boundary containing a number of  $Cell^{3D}$ s that may be  
 222 greater or less than 9, and its shape may not be regular. This  
 223 requires separate handling of the  $Cluster^{3D}$  at the boundary  
 224 in the  $Cluster^{3D}$  correction process described later in the pa-  
 225 per.

226 In subsequent steps, further layered modifications will be  
 227 made to the  $Cell^{2D}$ s included in the  $Cluster^{3D}$ . Therefore,  
 228 the  $Cluster^{3D}$  obtained in this section are referred to as the  
 229 temporary  $Cluster^{3D}$ .

### 230 3. Searching $Seed^{2D}$ and reconstructing $Cluster^{2D}$

231 Due to the incident angle of particles and the rotation of  
 232 certain modules, as the shower evolves longitudinally, the en-  
 233 ergy centroid of the shower will vary across different layers.  
 234 This results in the  $Cell^{2D}$  with the highest local energy in  
 235 each layer not always being encompassed within the  $Seed^{3D}$ ,  
 236 as depicted in Fig. 2c.

237 To identify the  $Seed^{2D}$  in each layer, we will iter-  
 238 ate through the  $Cell^{2D}$ s of each layer in the temporary  
 239  $Cluster^{3D}$  and select the  $Cell^{2D}$  with the highest energy  
 240 as the  $Seed^{2D}$  for that layer. Moreover, the overlap of  
 241  $Cluster^{2D}$ s will result in an increased accumulation of en-  
 242 ergy in shared  $Cell^{2D}$ s, which may cause the energy of a  
 243 shared  $Cell^{2D}$  to exceed that of the  $Seed^{2D}$ , leading to the  
 244 misidentification of a shared  $Cell^{2D}$  as a  $Seed^{2D}$ . Therefore,  
 245 before searching for  $Seed^{2D}$ , energy splitting needs to be per-  
 246 formed on all overlapping  $Cluster^{2D}$ s as shown in Fig. III B 3,  
 247 which will be discussed in detail in Sec. III B 3.

248 Subsequently,  $Cluster^{2D}$ s are formed with  $Seed^{2D}$ s as  
 249 the centre, and all  $Cell^{2D}$ s within the Molière radius of the

250 module and centred on  $Seed^{2D}$ s in the same layer are in-  
 251 cluded in the  $Cluster^{2D}$ s. The raw energy, position, and  
 252 timestamp of the  $Cluster^{2D}$ s are computed using the follow-  
 253 ing equations:

$$254 \quad \begin{aligned} E_{raw} &= \sum_{i=1}^n E_i, \\ r_{raw} &= \frac{\sum_{i=1}^n E_i * r_i}{E_{raw}}; \quad r = x \text{ or } y, \\ t_{raw} &= t_{Seed^{2D}}, \end{aligned} \quad (1)$$

255 where  $n$  represents the number of  $Cell^{2D}$ s in this  $Cluster^{2D}$ ,  
 256 and  $r_i$  and  $E_i$  represent the position and energy of the  
 257  $Cell^{2D}$ s.

258 Finally, a new  $Cluster^{3D}$  which contains the  $Cluster^{2D}$ s  
 259 in all layers is constructed. The raw energy of the  $Cluster^{3D}$   
 260 is computed by the formula below:

$$261 \quad E_{raw}^{3D} = \sum_{i=1}^n E_i, \quad (2)$$

262 where  $E_i$  also represents the energy of the  $Cell^{2D}$ s and  $n$  rep-  
 263 resents the number of the  $Cell^{2D}$ s in all layers incorporated  
 264 in the  $Cluster^{3D}$ . As shown in Fig. 2b, the energy deposi-  
 265 tion distribution of incident particles is dependent on the type  
 266 and energy of the incident particles. Therefore, the unre-  
 267 sonable  $Cluster^{3D}$ s can be filtered out based on the energy  
 268 ratio of  $Cluster^{2D}$ s in each layer. The position information  
 269 of  $Cluster^{2D}$ s is considered as a point of the incident par-  
 270 ticle momentum direction on the corresponding layer, with  
 271 the time information serving as the timestamp for this coordi-  
 272 nate point. Additionally, the energy information is regarded  
 273 as the total deposited energy of the particle in that layer. Re-  
 274 constructing and correcting the information of particles along  
 275 the momentum direction layer by layer will help improve the  
 276 position resolution, and this will be discussed in detail in  
 277 Sec. IV.

## 278 B. $Cluster^{3D}$ correction

279 The goal of the  $Cluster^{3D}$  correction is to reduce the bias  
 280 between the reconstructed values and the actual values, while  
 281 also aiming for the minimal standard deviation of the recon-  
 282 structed values. In the layered reconstruction framework,  
 283 the calculation and correction of the position and timestamp  
 284 of  $Cluster^{3D}$  will be carried out from the  $Cluster^{2D}$  level  
 285 firstly. As described in Sec. III A, the raw position and times-  
 286 tamp of the  $Cluster^{2D}$  can be calculated using the informa-  
 287 tion from the  $Cell^{2D}$ s in the  $Cluster^{2D}$ . After that, the raw  
 288 position and timestamp information of the  $Cluster^{2D}$  will be  
 289 corrected, and then the position and timestamp information of  
 290  $Cluster^{3D}$  will be calculated using the corrected  $Cluster^{2D}$ .  
 291 The energy of  $Cluster^{3D}$  will also be corrected using the  
 292 energy ratios of the  $Cluster^{2D}$ s in different layers. To pro-  
 293 vide a more detailed illustration of the specifics in the layered

294 corrections, Fig. 3 also displays some examples by the lon-  
 295 gitudinal segmented PicoCal in LHCb Upgrade II, where the  
 296 *Front* and *Back* represent the front and back layers of the  
 297 above-mentioned ECAL.

### 298 1. Energy correction

299 The objective of energy correction is to correct the energy  
 300 of the  $Cluster^{3D}$  to match that of the incident particle. Errors  
 301 in reconstructing the energy of the incident particle typically  
 302 stem from the following sources:

303 **Intrinsic error of ECAL readout cell:** It comes from the  
 304 response linearity of sensitive materials, thermal noise  
 305 in electronic systems, sampling errors in analogue to  
 306 digital converters (ADC), etc.

307 **Calibration error of the readout cell:** The shower develop-  
 308 ment in the longitudinal direction is energy related, and  
 309 the proportion of physical processes dominated in en-  
 310 ergy deposition changes at different stages of shower  
 311 development. This leads to changes in the sampling  
 312 fraction of the ECAL, which ultimately affects the cal-  
 313 ibration of the readout cell.

314 **Leakage of energy:** It is due to the incomplete deposition of  
 315 particle energy in ECAL and the use of finite-sized win-  
 316 dows during clustering.

317 **Fitting error of calibration and correction parameters:** It  
 318 is usually expressed as a constant term in the energy  
 319 resolution.

320 In the layered framework of this work, the energy correction  
 321 of  $Cluster^{3D}$ s is divided into two steps, as shown in Fig. 3a  
 322 and Fig. 3b. The initial correction of the energy of  $Cluster^{3D}$   
 323 is performed based on the energy ratio of  $Cluster^{2D}$ s in  
 324 the different layers. As shown in Fig. 3a, in the example  
 325 based on the PicoCal, we first correct the bias between the  
 326 reconstructed  $Cluster^{3D}$  energy and the true energy based  
 327 on the energy ratio of the front layer to the back layer. Sub-  
 328 sequently, as illustrated in Fig. 3b, further correction of the  
 329 energy of  $Cluster^{3D}$ s is conducted based on the total energy  
 330 of  $Cluster^{3D}$ s and it reduces the bias in the low energy re-  
 331 gion.

### 332 2. Position and time correction

333 When a particle passes through the ECAL, it showers and  
 334 deposits energy along the direction of the particle momen-  
 335 tum. The centre of gravity of the deposited energy in each  
 336 layer can be considered as a point in the direction of the parti-  
 337 cle momentum. In the layered reconstruction framework, the  
 338 position of the  $Cluster^{2D}$  is regarded as the reconstructed  
 339 position of centre of gravity. And  $Cluster^{2D}$ s will also pro-  
 340 vide the timestamp, which is related to the hit time of the  
 341 particle, for the layers they belong to. For the position and  
 342 time correction in this work, the layered correction is applied

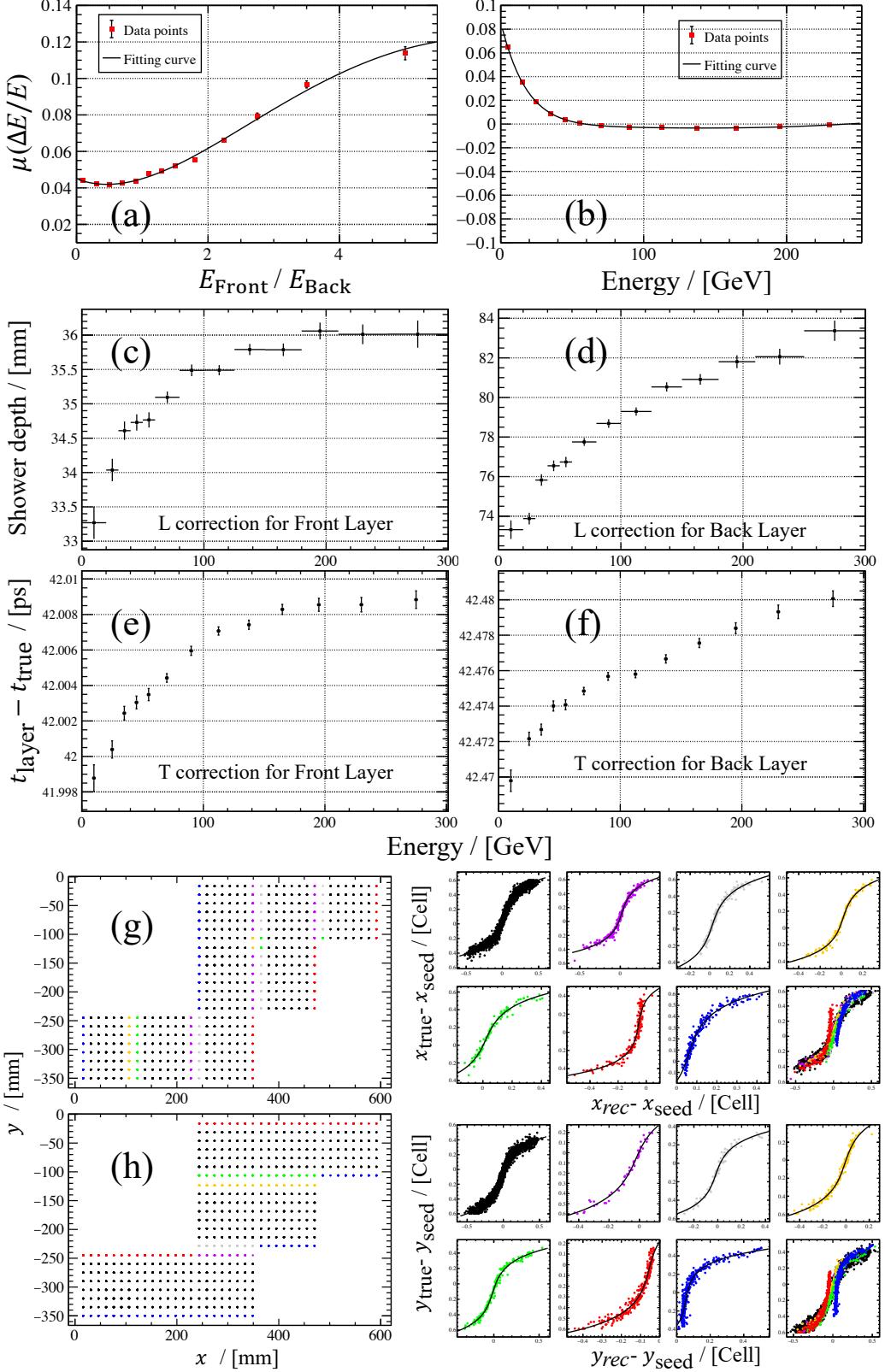


Fig. 3. (a, b): The energy correction. Here,  $\Delta E$  is the difference between the true energy and the reconstructed energy,  $E$  is the true energy, and  $\mu$  represents the mean value which is derived from the Gaussian fitting. (c, d): The  $L$  correction, where the shower depth is measured from the front surface of the ECAL. (e, f): The time correction points, where  $t_{true}$  is the true time of the particle at the front face of the ECAL. (g, h): The  $S$  correction.

343 to  $Cluster^{2D}$ s firstly, followed by the utilization of the cor- 344 rected information from  $Cluster^{2D}$ s to calculate the infor-

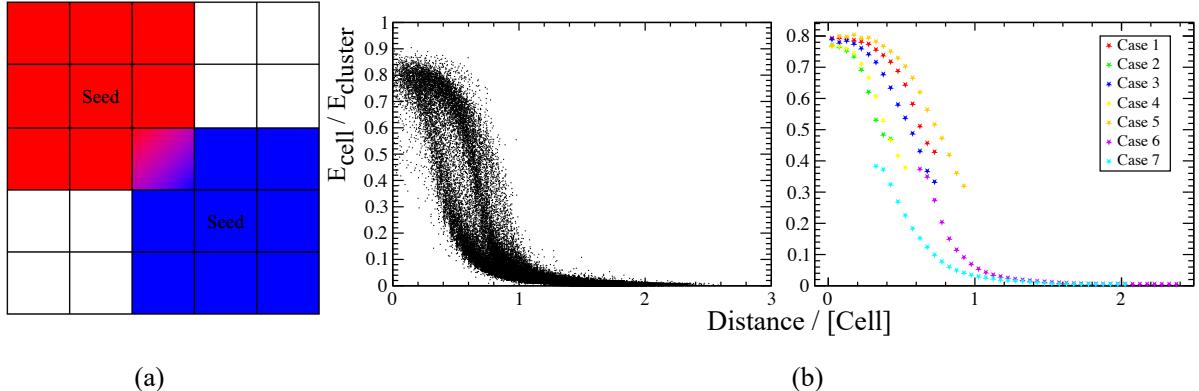


Fig. 4. (a): Two overlapping clusters shared the same cell. (b): The transverse shower profile, where the  $y$  axis is the fraction of the energy of the  $Cell^{2D}$ s to the energy of the  $Cluster^{2D}$ s, and the  $x$  axis is the distance between the centre of the  $Cell^{2D}$ s and the centre of the  $Cluster^{2D}$ s.

345 mation of  $Cluster^{3D}$ s.

346 The purpose of the position correction is to correct the re-  
347 constructed position of the  $Cluster^{2D}$  as accurately as pos-  
348 sible to the centre of gravity of the energy deposited by the  
349 particles in each layer.

350 For the  $Cluster^{2D}$ , the  $x/y$  position information is derived  
351 from the energy-weighted positions of the  $Cell^{2D}$ s. Based  
352 on the model mentioned in Ref. [33], we define  $\Delta r_{rec}$  as the  
353 position of  $Cluster^{2D}$  minus the position of  $Seed^{2D}$ , and  
354  $\Delta r_{true}$  as the position of the true transversal energy barycen-  
355 tre minus the position of  $Seed^{2D}$ , in each layer. This work ex-  
356 plores the relationship between  $\Delta r_{rec}$  and  $\Delta r_{true}$ . As shown  
357 in Fig. 3g and Fig. 3h, the shape of this relationship is like  
358 an  $S$ , so we also call the process of correcting the  $x/y$  co-  
359 ordinates "S correction". And  $S$  shape is affected by where  
360 the  $Seed^{2D}$  is located. When the  $Seed^{2D}$  is positioned at the  
361 boundaries of the region, the introduction of varying cell size  
362 of  $Cell^{2D}$  and the presence of installation gaps will have an  
363 impact on the  $S$  shape. This results in a different  $S$  shape for  
364  $Cluster^{2D}$ s locating at the boundary of the region compared  
365 to those inside the region, as also illustrated in Fig. 3g and  
366 Fig. 3h.

367 The  $z$  coordinate of the gravity center of the deposition en-  
368 ergy is also usually used to evaluate the depth of the shower.  
369 Due to the typically small granularity and thick layers of  
370 ECAL in the longitudinal direction, directly using the  $z$  co-  
371 ordinate information of the  $Cell^{2D}$  to reconstruct the  $z$  co-  
372 ordinate of the gravity center of the deposition energy in  
373 each layer would introduce substantial uncertainty. There-  
374 fore, the reconstruction of the  $z$  coordinate is typically per-  
375 formed based on the energy of the incident particles. As  
376 shown in Fig. 3c and Fig. 3d, the shower depth (Difference  
377 between the  $z$  coordinate of the shower and the  $z$  coordinate  
378 of the front face of the module) is logarithmically related to  
379 the incident particle energy due to the pair production of elec-  
380 trons dominated the energy deposition[34]. This is the ratio-  
381 nate behind the term "L correction" for this correction step.  
382 By leveraging this correlation, we are able to deduce the  $z$

383 coordinate of the  $Cluster^{2D}$  based on the energy of the in-  
384 coming particle.

385 For the  $Cluster^{2D}$ s, the positions obtained by the above  
386 position correction are also projected onto the front surface  
387 of ECAL, and then will be used in the subsequent steps to  
388 calculate the position information of the  $Cluster^{3D}$ s.

389 In this work, the timestamp of the  $Seed^{2D}$ s are used as the  
390 timestamp for  $Cluster^{2D}$ s in the preliminary study. The pur-  
391 pose of time correction is to determine the time difference be-  
392 tween the timestamps of the  $Cluster^{2D}$  in each layer and the  
393 moment when the particle reaches a specific reference plane.  
394 This time difference is employed to correct the timestamp of  
395 the  $Cluster^{2D}$  to the accurate time on a designated reference  
396 plane. And the front surface of ECAL is used as the reference  
397 plane for time correction in this work. Through research, this  
398 time difference is related to the energy of the incident parti-  
399 cle, and the results of the correction are shown in Fig. 3e and  
400 Fig. 3f. Furthermore, if there is a rotation of the module, it  
401 will result in a longitudinal positional difference of  $Cell^{2D}$ s  
402 at different transverse positions on the same layer. This leads  
403 to a time difference for particles reaching different  $Seed^{2D}$ s  
404 on the same layer. Hence, it needs to compensate for this  
405 time difference based on the longitudinal position difference  
406 of  $Seed^{2D}$ s by following:

$$407 \quad t'_{Seed^{2D}} = (t_{Seed^{2D}} + \frac{z_{Seed^{2D}} - z_{layer}}{v_z}), \quad (3)$$

408 where  $t'_{Seed^{2D}}$  represents the compensated time of the  
409  $Seed^{2D}$ , and  $v_z$  represents the velocity of the particle along  
410 the direction of the beam pipe.

411 After obtaining the corrected position and time informa-  
412 tion of  $Cluster^{2D}$ s, the time and position information of  
413  $Cluster^{3D}$ s are obtained by weighting the time or position  
414 information of  $Cluster^{2D}$ s as follows:

$$\begin{aligned}
V &= r \text{ or } t, \\
W_i(V) &= \frac{1}{Res_i(V)^2}, \\
V_{Cluster^{3D}} &= \frac{\sum_{i=1}^n (V_{Cluster_i^{2D}} \times W_i(V))}{\sum_{i=1}^n W_i(V)},
\end{aligned} \tag{4}$$

416 where the  $r$  represents the position,  $t$  represents the time,  $i$  417 represents the layer number and  $Res_i$  represents resolution 418 of  $r$  or  $t$  in layer  $i$ , which are shown in Fig. 6b and Fig. 6c.

### 419 3. Splitting of overlapping clusters

420 When there is an overlap of two  $Cluster^{3D}$ s in an event, 421 as depicted in Fig. 4a, it becomes necessary to conduct en- 422 ergy splitting on the shared  $Cell^{2D}$ s to ensure accurate re- 423 construction of the energy and position of the  $Cluster^{3D}$ s. In 424 the layered reconstruction framework, the energy splitting of 425 the overlapping  $Cluster^{3D}$ s is carried out at the  $Cluster^{2D}$  426 level. The general logic of the algorithm is as follows: first, 427 determine if the two  $Cluster^{3D}$ s share any  $Cell^{2D}$ s. If they 428 do, distribute the energy of the shared  $Cell^{2D}$ s between the 429 respective  $Cluster^{2D}$ s. Upon completing the energy splitting 430 of  $Cell^{2D}$ s, reevaluate the information of  $Cluster^{2D}$ s based 431 on the updated energy of  $Cell^{2D}$ s and remake necessary cor- 432 rections.

433 Currently, the energy splitting is determined by the trans- 434 verse shower profile obtained from MC truth information. 435 This work provides a layered description of the transverse 436 shower profile at the  $Cell^{2D}$  level. As shown in Fig. 4b, the 437 transverse shower profile is represented with the distance of 438  $Cell^{2D}$ s from  $Cluster^{2D}$ s on the  $x$  axis, and the energy frac- 439 tion of  $Cell^{2D}$ s relative to  $Cluster^{2D}$ s on the  $y$  axis.

440 When a  $Cell^{2D}$  is shared by two  $Cluster^{2D}$ s, the distribu- 441 tion of  $Cell^{2D}$  energy to each  $Cluster^{2D}$  is evaluated by two 442 steps. Firstly, the energy fraction of the shared  $Cell^{2D}$  corre- 443 sponding to each  $Cluster^{2D}$  is calculated based on the dis- 444 tance between the  $Cell^{2D}$  and the  $Cluster^{2D}$ s, as depicted in 445 Fig. 4b. Secondly, the estimated energy from each of the two 446  $Cluster^{2D}$ s to the  $Cell^{2D}$  is computed by the fraction es- 447 tablished in the first step and the energy of the  $Cluster^{2D}$ s. 448 At this juncture, the total estimated energy from the two 449  $Cluster^{2D}$ s to the shared  $Cell^{2D}$  exceeding the energy of 450 the shared  $Cell^{2D}$ . The energy of the shared  $Cell^{2D}$  is then 451 distributed between the two  $Cluster^{2D}$ s using the aforemen- 452 tioned calculated estimated energy as the weighting factor. 453 Subsequently, the energy and position of the  $Cluster^{2D}$  are 454 recalculated, and the aforementioned procedures are iterated. 455 Upon the stabilization of the splitting weights of the shared 456  $Cell^{2D}$  for two  $Cluster^{2D}$ s, this iterative process completes 457 and finalizes the energy splitting of the shared  $Cell^{2D}$ .

458 The precision of the energy fraction contributed by 459  $Cell^{2D}$ s to each  $Cluster^{2D}$  heavily relies on the accuracy 460 of the transverse shower profile. As depicted in Fig. 4b, 461 even when the distances between  $Cell^{2D}$ s and their respec- 462 tive  $Cluster^{2D}$ s are identical, the energy contribution from 463  $Cell^{2D}$ s to  $Cluster^{2D}$ s can vary significantly, and even dis- 464 playing multiple peaks, particularly around distances of ap-

465 proximately 0.5 [Cell]. So, it is essential to categorize the 466 data points in the left plot of Fig. 4b to achieve narrower frac- 467 tion ranges corresponding to the same distance within a single 468 category, as well as a singular peak in the energy fraction.

469 The classification method used in this work is in table 1 470 and the classification result is shown in the right plot of the 471 Fig. 4b. Firstly, whether this  $Cell^{2D}$  is a  $Seed^{2D}$  should be 472 determined. This is because the random scattering direction 473 of the initial electron pairs affects which  $Cell^{2D}$  near the hit 474 point has the opportunity to receive more energy deposition. 475 And a  $Cell^{2D}$  deposited the maximum energy is constructed 476 as a  $Seed^{2D}$  in reconstruction process. Additionally, due to 477 the shape of the readout unit ( $Cell^{2D}$ ) not being a circle, the 478 position of the hit point relative to the edges or corners of the 479  $Seed^{2D}$  also affects the energy fraction of the  $Seed^{2D}$  when 480 the distance to the hit point is the same. Finally, the position 481 of the hit point and the  $Cell^{2D}$ s relative to the  $Seed^{2D}$  in the 482 positive or negative direction of the particle's transverse mo- 483 mentum also affects the energy fraction, and this positional 484 relationship can be described as being relatively close to or 485 far from the beam pipe in LHCb. In practical operations, the 486 hit position of particles in each layer is substituted by the po- 487 sition of  $Cluster^{2D}$ s.

### 488 C. Merged $\pi^0$ reconstruction

489 When two photons produced by  $\pi^0$  cannot be reconstructed 490 individually as two  $Cluster^{3D}$ s due to the proximity of 491 the hit points, this  $\pi^0$  is referred to as merged  $\pi^0$ . This 492 section will describe how to reconstruct the potential sub- 493  $Cluster^{3D}$  pair, which is considered to be the candidates of 494 the photon pair from merged  $\pi^0$ , from a directly reconstructed 495  $Cluster^{3D}$ . Then, the sub- $Cluster^{3D}$  pair is used to recon- 496 struct merged  $\pi^0$ . The workflow chart for merged  $\pi^0$  recon- 497 struction is shown in Fig. 5b. The following subsection will 498 focus on the algorithms associated with the first and last steps 499 in the workflow chart that have not appeared in single-photon 500 reconstruction.

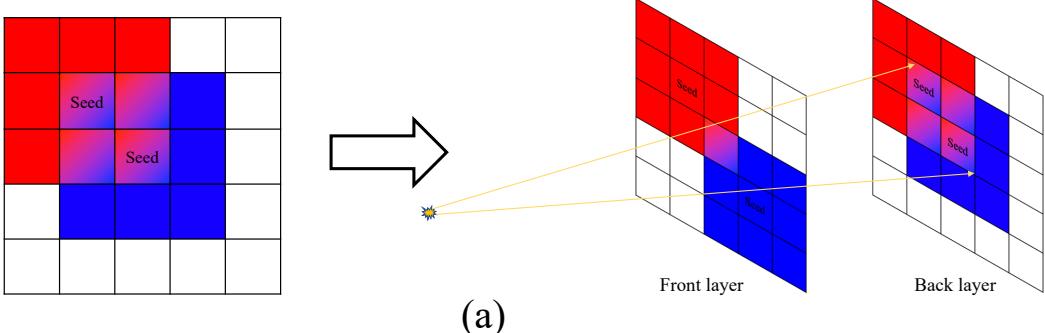
#### 501 1. Searching the second $Seed^{2D}$ in $Cluster^{2D}$ s

502 During the reconstruction process, a merged  $\pi^0$  denotes its 503 generated photon pair being reconstructed as one  $Cluster^{3D}$  504 in the ECAL. And this indicates that the energy deposi- 505 tion from the  $\pi^0$  only produces one local maximum energy 506  $Cell^{3D}$ . For the unlayered reconstruction framework in some 507 experiments [35, 36], where layered readout information is 508 lacking, it is a common practice to select one of the non- 509 Seeded cells in the cluster with the highest energy cell as the 510 second seed. Then, a new cluster is constructed around the 511 second seed as the centre. After splitting the energy of the 512 shared cells between the new cluster and the original cluster, 513 the overlapping clusters are referred to as sub-cluster pair of 514 the original cluster.

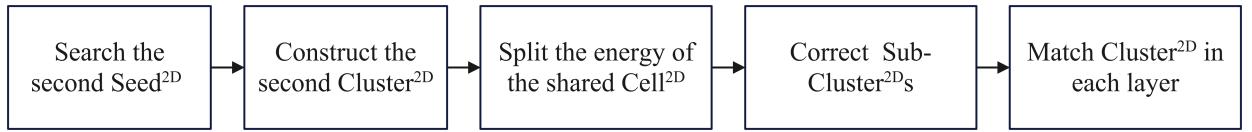
515 In fact, as shown in Fig. 5a, a merged  $\pi^0$  does not nec- 516 cessarily result in "merged"  $Cluster^{2D}$  in each layer. It is a

Table 1. The classification of transverse shower profile.

Case	Cell type	Hit position relative to Seed	Cell relative to Seed
1	Seed	1: In the positive direction of $p_T$ ; 2: Near the edges of the Seed	/
2	Seed	1: In the negative direction of $p_T$ ; 2: Near the edges of the Seed	/
3	Seed	1: In the positive direction of $p_T$ ; 2: Near the corner of the Seed	/
4	Seed	1: In the negative direction of $p_T$ ; 2: Near the corner of the Seed	/
5	Seed	Near the corner closest to the direction of $p_T$ of the Seed	/
6	Cell	/	In the positive direction of $p_T$
7	Cell	/	In the negative direction of $p_T$



(a)



(b)

Fig. 5. (a): A possible  $Cell^{3D}$ 's response and  $Cell^{2D}$ 's response in each layer of a longitudinal segmented ECAL of a merged  $\pi^0$ . (b): Reconstruction flow chart for merged  $\pi^0$ .

517 well-established fact that, according to the cell energy splitting  
 518 algorithm described above, the success rate of splitting  
 519 increases as the number of cells shared by two clusters de-  
 520 creases.

521 Furthermore, it would be unjust to solely base the selec-  
 522 tion of the second  $Seed^{2D}$  on the energy of  $Cell^{2D}$ 's. Be-  
 523 cause the energy of  $Cell^{2D}$ 's are also related to the distance  
 524 from the hit point of photon. When one of the photons re-  
 525 sulting from the decay of a  $\pi^0$  has much higher energy than  
 526 the other photon, in non- $Seed^{2D}$   $Cell^{2D}$ 's, the  $Cell^{2D}$  closer  
 527 to the higher-energy photon may have higher energy than the  
 528  $Cell^{2D}$  closest to the lower-energy photon. Solely focusing  
 529 on the energy of  $Cell^{2D}$  may result in misidentification of the  
 530 second  $Seed^{2D}$ .

531 Hence, motivated by the aforementioned reasons, the lay-  
 532 ered reconstruction framework described in this work in-  
 533 volves a two-step process for identifying the second  $Seed^{2D}$   
 534 , aiming to enhance the accuracy of splitting  $Cluster^{2D}$  and  
 535 ultimately improve the efficiency of  $\pi^0$  reconstruction.

536 The first step is to search the  $Cell^{2D}$ , except for the  
 537  $Seed^{2D}$ , with the highest energy of  $E'$  in  $Cluster^{2D}$  as the  
 538  $Cell^{2D}$ . The definition of  $E'$  can be found in the following  
 539 equation:

$$540 \quad E' = \frac{E(Cell^{2D})}{Frc}, \quad (5)$$

541 where the  $Frc$  is estimated ratio of the  $Cell^{2D}$  and ob-  
 542 tained by the relationship shown in Fig. 4b. The second  
 543 step is to search whether there is any energy local maxi-  
 544 mum  $Cell^{2D}$  other than  $Seed^{2D}$  in the neighbouring  $Cell^{2D}$ 's  
 545 of the  $Cell^{2D}$  found in the first step. If there is, then the  
 546  $Cell^{2D}$  with this energy local maximum is taken as the sec-  
 547 ond  $Seed^{2D}$ , otherwise the  $Cell^{2D}$ ' is taken as the second  
 548  $Seed^{2D}$ . Subsequently, the second  $Seed^{2D}$  is used to con-  
 549 struct a new  $Cluster^{2D}$  and the energy splitting for shared  
 550  $Cell^{2D}$  and correction for  $Cluster^{2D}$  will be done as detailed  
 551 in previous sections.

## 552 2. $Cluster^{2D}$ matching

553 After completing the preliminary algorithm, there is sub-  
 554  $Cluster^{2D}$  pair obtained in each layer. The algorithm de-  
 555 scribed in this section aims to match the sub- $Cluster^{2D}$ 's in  
 556 different layers, and finally obtain two sub- $Cluster^{3D}$ 's. The  
 557 sub- $Cluster^{3D}$  pair is regard as the photons generated by  
 558 merged  $\pi^0$ . The matching of  $Cluster^{2D}$  on different lay-

ers will directly affect the correctness of the reconstruction of the final sub- $Cluster^{3D}$ . The utilization of the multi-dimensional information from different readout layers facilitates more accurate  $Cluster^{2D}$  matching.

At first, the energy of sub- $Cluster^{2D}$ s in each layer is used for pre-matching. Since the ratio of deposition energy in each layer is related to the energy of the incident particles[25], unreasonable matches can be filtered out based on the energy ratios between the  $Cluster^{2D}$ s and the energy of the  $Cluster^{3D}$  as Fig. 2b. For example, in the case of a dual-layer ECAL, the energy of the  $Cluster^{2D}$ s in the front layer is used to calculate the energy of the  $Cluster^{2D}$ s in the other layers, and if the energy of the  $Cluster^{2D}$ s in the other layers exceeds the calculated value by  $3\sigma$ , the pre-matching is considered as a failure, and the matching result is filtered out.

If there is more than one  $Cluster^{2D}$ s in a certain layer pre-matched with the front layer, the final match is made based on the positional relationship. First, the  $Cluster^{2D}$  in the front layer is connected with the initial vertex (usually the zero point). The connection line is extended and projected to the those layers, and the closest pre-matched  $Cluster^{2D}$ s to the projection point are matched with the front layer  $Cluster^{2D}$  to complete the matching and get the sub- $Cluster^{3D}$ .

Finally, in order to avoid resolved  $\pi^0$  being reconstructed in a merged model,  $Seed^{2D}$ s in all layers of sub- $Cluster^{3D}$  need to be checked whether they are included in a direct reconstruction  $Cluster^{3D}$ . If so, the current process of merged  $\pi^0$  reconstruction will be terminated and a new process will start by skipping to the next directly reconstructed  $Cluster^{3D}$ .

#### IV. PERFORMANCE

In the context of the LHCb experiment, a Phase-II Upgrade (LHCb Upgrade II) has been proposed[37]. Scheduled for installation at the beginning of LHC Run 5 around 2036, the LHCb Upgrade II aims to enhance the experiment's capabilities for exploring the frontiers of particle physics. The PicoCal is designed with a longitudinal layered ECAL structure. The Shashlik calorimeter structure [38, 39] will be retained in the outer region of the PicoCal, while the Spaghetti calorimeter (SpaCal) [40, 41] will be employed in the central region. The GAGG crystal, known for its great radiation resistance, high light yield, and excellent time response performance[42–47], will be introduced as a sensitive material into the most central region with the highest radiation dose. Reduced detector occupancy will be achieved by designing and using modules with smaller Molière radius to achieve smaller readout cell sizes in the internal regions with the highest detector occupancy. The detailed layout is provided in table 2.

In this section, based on the above layout, a series of single-photon and  $\pi^0$  samples are used to demonstrate the performance of the layer reconstruction algorithm in this framework. Additionally, the unlayered reconstruction algorithm[33] employed in Run 1/2 of LHCb is introduced for comparison. To ensure fairness, the unlayered reconstruction algorithm remains consistent with layered reconstruction

algorithm in cluster correction, overlapping cluster splitting, and other steps, except for the utilization of layered information.

##### A. Single photon performance

The single photon samples utilized in this section are generated and simulated using the "Hybrid MC" simulation framework [48], which is built upon the GEANT4 Monte Carlo package [49]. The performance of the layered reconstruction algorithm in this framework will be demonstrated in terms of energy, position, and time resolution.

Table 2. Modules in 2023 baseline setup of PicoCal.

Region	Type	Absorber/Crystal	Cell size [cm <sup>2</sup> ]	$R_M$ [mm]	Layers
1	Shashlik	Lead/Polystyrene	12×12	35.0	2
2	Shashlik	Lead/Polystyrene	6×6	35.0	2
3	Shashlik	Lead/Polystyrene	4×4	35.0	2
4-7	SpaCal	Lead/Polystyrene	3×3	29.5	2
8-11	SpaCal	Tungsten/GAGG	1.5×1.5	14.5	2

###### 1. Energy resolution

The Fig. 6a illustrates the energy resolution versus the incident energy. And the relationship is described by the following equation:

$$\sigma(E)/E = \frac{a}{\sqrt{E}} \oplus b, \quad (6)$$

where  $a$  represents the statistical fluctuations of the readout signal (e.g., photoelectrons),  $b$  represents constant term errors due to uncertainties in the calibration and correction, as well as inhomogeneities in the active material, and  $\oplus$  represents the sum of squares. The energy resolution and bias as a function of energy illustrate the stability of the layered reconstruction framework. And, as illustrated in Fig. 7, layered reconstruction algorithm demonstrates better energy resolution for the particles with large incident angles. However, due to the forward detector design and the layout of the PicoCal[31], there are fewer single-photon events with large incident angles. Therefore, this improvement is not significantly reflected in the energy resolution as a function of the incident particle energy.

###### 2. Position resolution

The position resolution is a critical parameter of the ECAL and, to some extent, is also equivalent to angular resolution. The position resolution is illustrated in Fig. 6b and d, where the *Front* and *Back* represent the front and back layer,  $r$  represent the position. As particles undergo showering and

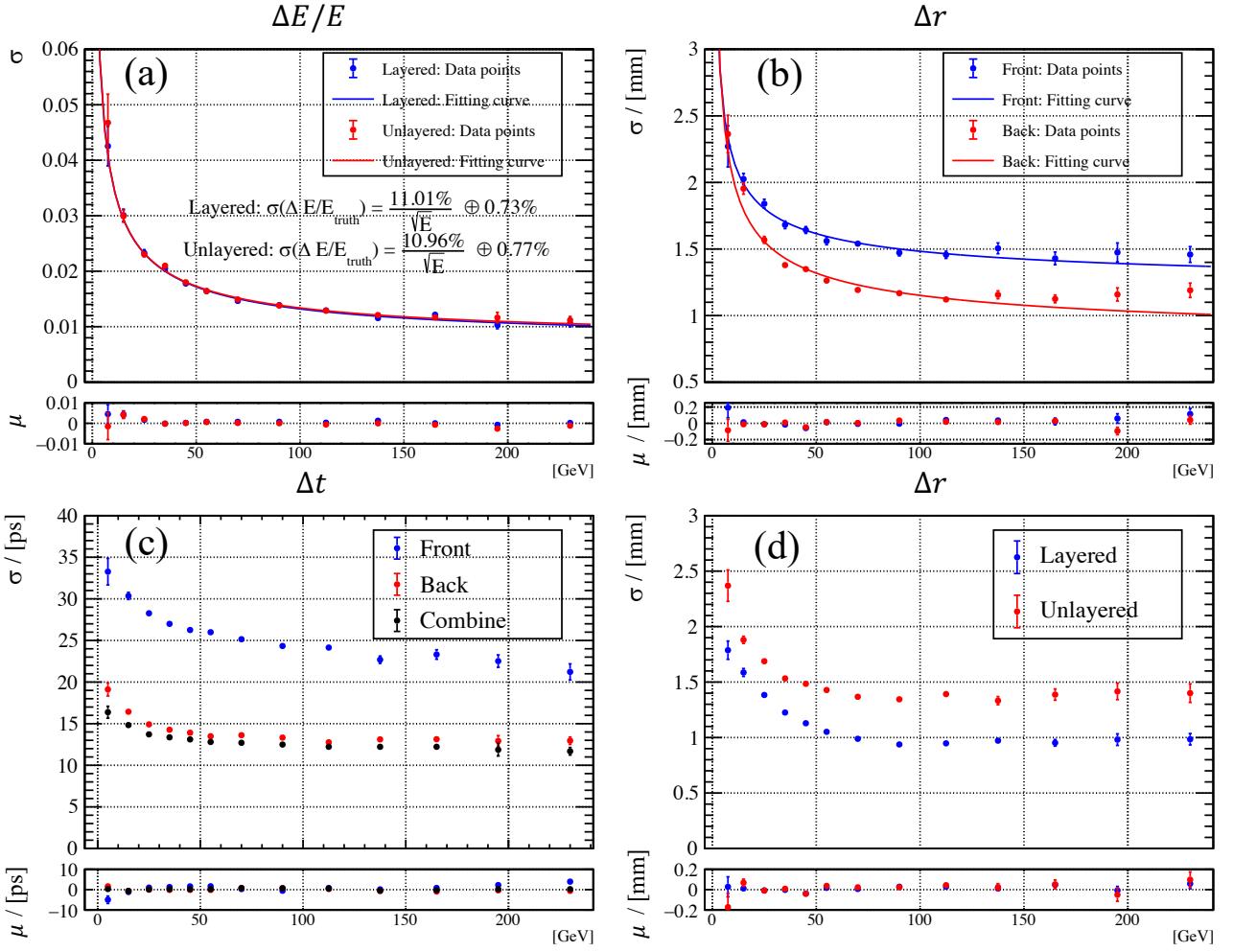


Fig. 6. The resolution and bias relative to the true value in regions 4-7.  $\sigma$  and  $\mu$  are derived from the Gaussian fitting, where  $\sigma$  represents the standard deviation (used to denote the resolution) and  $\mu$  is the mean value (used to denote the bias). (a): The energy resolution and bias, where  $\Delta E$  is the difference between the true energy and the reconstructed energy, and  $E$  is the true energy. (b): The position resolution and bias of front and back layers, where  $\Delta r$  is the difference between the true position and the reconstructed position. (c): The time resolution and bias, where  $\Delta t$  is the difference between the true time and the reconstructed time. (d): The position resolution and bias, where  $\Delta r$  is the difference between the true position and the reconstructed position.

deposit energy along their momentum direction, the development stages of the shower will change, as well as the readout layer it is on. However, the tendency for the reconstructed  $Cluster^{2D}$ 's raw position relative to the true position will vary between different layers. Essentially, if we only have energy-weighted position information of  $Cell^{2D}$ 's located in different layers, the raw position will spread out in the transverse plane due to the different tendency. Consequently, utilizing an unlayered reconstruction algorithm and an overall correction parameters for reconstructing the transverse position will lead to a degradation of the position resolution due to this spreading effect. In contrast, the reconstruction in this work effectively resolves the previously mentioned issue and improves the positional resolution, as illustrated in Fig. 6d. This enhancement results in an improvement of approximately 0.5 mm in the high-energy region, representing a 33% increase compared to the unlayered reconstruction algo-

rithm.

### 3. Time resolution

Time information is essential for event reconstruction and data analysis in the high luminosity environment. Within the layered reconstruction framework, time information can be provided in the form of  $Cluster^{3D}$  or along the longitudinal direction using  $Cluster^{2D}$ , as depicted in Fig. 6c. The integration of layered time information will provide new analytical perspectives for upcoming physical investigations. And ongoing research is also focusing on exploring the application of time information in reconstruction, correction, and analyses.

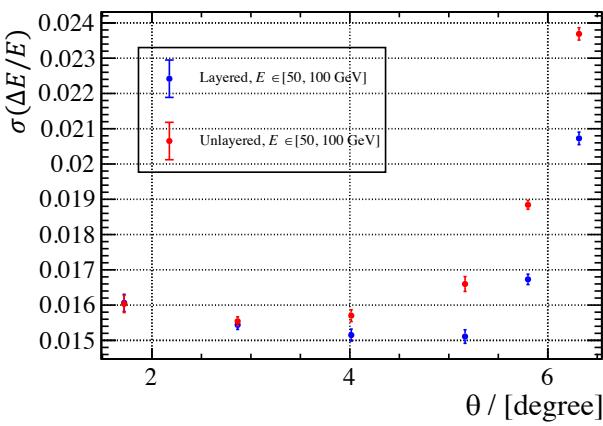


Fig. 7. The energy resolution versus angle  $\theta$  in regions 4-7. Here,  $\theta$  is the angle between the particle's motion direction and the beam direction.  $\Delta E$  represents the difference between the true energy and the reconstructed energy, and the  $E$  represents the true energy.  $\sigma$  is the standard deviation and derived from the Gaussian fitting.

678

### B. $\pi^0$ reconstruction performance

679 In this section, around 30000 signal  $\pi^0$  events from  $B^0 \rightarrow$   
680  $\pi^+\pi^-\pi^0$  have been generated by the generation part of  
681 Gauss[50], with the requirement that all final-state photons  
682 from  $\pi^0$  should to be contained within the acceptance region  
683 of the ECAL. The transverse momentum distribution of the  
684  $\pi^0$ 's is shown in Fig. 8a. Those samples are used as a bench-  
685 mark to test the contribution of the layered reconstruction al-  
686 gorithm in this framework to the reconstruction performance  
687 of  $\pi^0$  particles. The matched  $M(\gamma\gamma)$  distribution which com-  
688 pare with the unlayered reconstruction algorithm is shown  
689 in Fig. 8b and Fig. 8c. And the reconstruction efficiency  
690 of  $\pi^0$  based on layered reconstruction framework is shown  
691 in Fig. 8f. The efficiency comparison between the layered  
692 and unlayered reconstruction algorithms is shown in Fig. 8d  
693 and Fig. 8e, with resolved and merged modes presented sep-  
694 arately.

695 As shown in Fig. 8d, as expected, utilizing the layered re-  
696 construction algorithm in this framework improves the abil-  
697 ity to split overlapping  $Cluster^{3D}$ 's, leading to a 10% in-  
698 crease in the efficiency of reconstructing merged  $\pi^0$ . And  
699 the improvement of position resolution of single photon con-  
700 tributes to the resolution improvement of  $\pi^0$  mass distribution  
701 as shown in Fig. 8b and Fig. 8c.

702

## V. COMPUTATION

703 This framework allows for task splitting according to  
704 events, enabling different events to be deployed as sepa-  
705 rate tasks. Based on this framework, we evaluated the  
706 runtime of  $Cluster^{3D}$  reconstruction under the LHCb Pic-  
707 oCal at a center-of-mass energy of 14 TeV and an in-  
708 stantaneous luminosity of  $1.5 \times 10^{34} \text{ cm}^{-2}\text{s}^{-1}$ . The  
709 framework is deployed in a cluster CPU with CPU

710 *Intel(R) Xeon(R) Platinum 9242 CPU @ 2.30 GHz* for  
711 each task. Since the events are independent of each other  
712 in this framework, we only consider the time consump-  
713 tion of the reconstruction for each individual event. For compar-  
714 ison, we also introduced the unlayered reconstruction algo-  
715 rithm used in LHCb, with the results shown in Fig. 9. Com-  
716 pared to the unlayered reconstruction algorithm, the layered  
717 reconstruction algorithm does not significantly increase com-  
718 putation time.

719 In a CPU cluster, scalability is a critical consideration.  
720 Within this framework, an event is defined as the smallest  
721 unit of a cluster task. This approach facilitates efficient task  
722 management and resource allocation. By increasing the num-  
723 ber of computing nodes, the number of events processed in  
724 parallel can be increased, thereby reducing the overall run-  
725 time of the tasks. And utilizing more powerful CPUs in each  
726 computing node can enhance the computation speed for event  
727 reconstruction.

728 In the reconstruction process of each event, the time com-  
729 plexity of each step in the flowchart shown in Fig. 2d is pre-  
730 sented in table 3. Here,  $n_1$  represents the number of the  
731  $Cell^{2D}$ 's,  $n_2$  represents the number of the  $Cell^{3D}$ 's,  $n_3$  rep-  
732 presents the number of the  $Seed^{3D}$ 's, and  $n_4$  represents the  
733 number of the  $Cluster^{3D}$ 's. Taking parallelism within an  
734 event into account, the structure of these processes in this  
735 framework has been designed for future deployment on nodes  
736 with parallel computing capabilities, such as GPUs or FP-  
737 GAs. This establishes a solid foundation for the future de-  
738 ployment and acceleration of these algorithms on GPU clus-  
739 ters and FPGA platforms.

740

## VI. CONCLUSION

741 As depicted in Fig. 1, this work has accomplished the  
742 development of a software framework for longitudinal seg-  
743 mented ECAL event reconstruction. Moreover, the layered  
744 reconstruction algorithm has been devised within this frame-  
745 work for  $Cluster^{3D}$ 's and merged  $\pi^0$ . In this framework, it  
746 not only furnishes the general direction, arrival time, and en-  
747 ergy of the particle candidates by the  $Cluster^{3D}$  format, but  
748 also provides position, timestamp, and energy deposition in  
749 each layer by the  $Cluster^{2D}$  format. The information from  
750 the  $Cluster^{2D}$ 's can not only be used to filter out unreason-  
751 able  $Cluster^{3D}$ 's during reconstruction, but also provide new  
752 perspectives in physics analysis.

753 To achieve a more refined correction of the  $Cluster^{3D}$  in-  
754 formation, this work leveraged the advantages of a layered  
755 reconstruction framework to provide layered information and  
756 designed a layered correction method and process. In terms of  
757 energy correction, compared to solely using the  $Cluster^{3D}$   
758 energy for correction, this work further utilized the energy ra-  
759 tios of the  $Cluster^{2D}$  in each layer for correction, aiming to  
760 better compensate for the longitudinal variation in sampling  
761 fraction of the ECAL. For the correction of time and position  
762 information, this work first corrected the corresponding infor-  
763 mation of the  $Cluster^{2D}$ 's, and then weighted the corrected  
764  $Cluster^{2D}$  information based on the resolution of the corre-

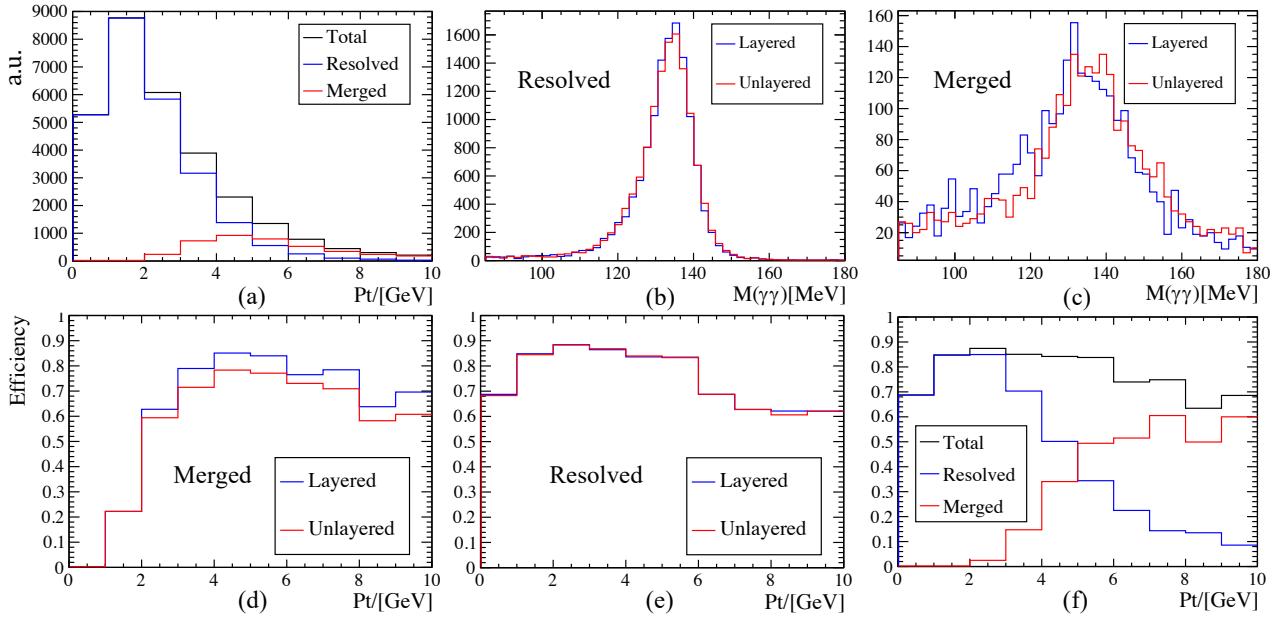


Fig. 8. (a): The transverse momentum distribution of  $\pi^0$  from  $B^0 \rightarrow \pi^+ \pi^- \pi^0$ . (b): The distribution of  $M(\gamma\gamma)$  of matched candidates in the resolved model in the SpaCal region. (c): The distribution of  $M(\gamma\gamma)$  of matched candidates in the merged model in the SpaCal region. (d): The reconstruction efficiency of merged  $\pi^0$  from  $B^0 \rightarrow \pi^+ \pi^- \pi^0$ . (e): The reconstruction efficiency of resolved  $\pi^0$  from  $B^0 \rightarrow \pi^+ \pi^- \pi^0$ . (f): The total reconstruction efficiency of  $\pi^0$  from  $B^0 \rightarrow \pi^+ \pi^- \pi^0$  in layered reconstruction framework.

Table 3. The time complexity.

Algorithm	Time complexity
Construct $Cell^{3D}$ s	$O(n_1)$
Search $Seed^{3D}$ s	$O(n_2)$
Construct $Cluster^{3D}$ s	$O(n_3)$
Split overlapping $Cluster^{3D}$ s	$O(n_4)$
Search $Seed^{2D}$ s/Construct $Cluster^{2D}$ s	$O(n_4)$
Correct $Cluster^{3D}$ s	$O(n_4)$

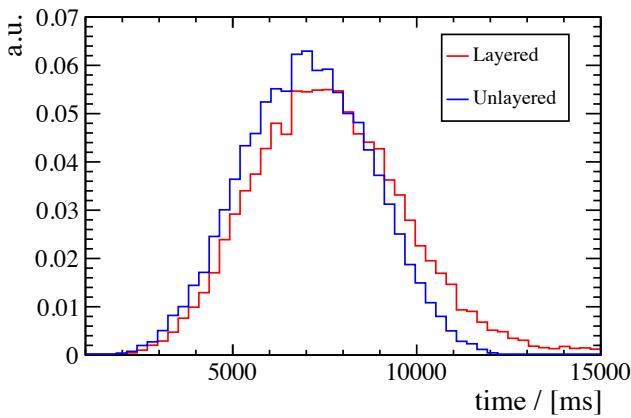


Fig. 9. The time consumption distribution for each event.

sponding information in each layer. The weighted result is used as the corrected information for the  $Cluster^{3D}$ . More-

over, this work delves into the transverse shower profile and systematically elucidates the relationship between distance and energy ratio between  $Cell^{2D}$ s and  $Cluster^{2D}$ . This information provides more precise prior knowledge for the splitting of the overlapping  $Cluster^{3D}$ s.

Finally, the performance of the framework was validated using the PicoCal in LHCb Upgrade II. The results show that the layered reconstruction algorithm in this framework significantly improves the position resolution of the single-photon and the energy resolution of the particles at large incident angles compared to the unlayered reconstruction algorithm. For example, in regions 4-7 of the specified setup, the position resolution has enhanced from approximately 1.4 mm to 0.9 mm in the high-energy region. Additionally, the energy resolution has improved by about 10% at large incident angles. Furthermore, the layered reconstruction algorithm enhances the splitting capability of overlapping clusters, leading to a further improvement in the efficiency of merged  $\pi^0$  reconstruction. In the current version of the algorithms, it can increase the reconstruction efficiency of merged  $\pi^0$  by approx-

imately 10% at the SpaCal in the mentioned setup.

Furthermore, this work provides a suitable software platform for future research on layered ECAL. Since it incorporates comprehensive data structures and application programming interfaces (APIs), along with straightforward configuration and execution procedures. This feature allows for convenient secondary development leveraging the framework to substitute and validate new algorithms. And this also facilitating investigations into ECAL-related physics. In future work, we will continue to explore various facets utilizing the multi-dimensional information and scalability provided by this software framework. This includes delving into the application of deep learning in cluster splitting and cluster in-

formation correction, evaluating the performance of different cluster shapes, and scrutinizing the application of time information in cluster reconstruction, among others.

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811 [1] X.Z. Yu, X.Y. Wang, W.H. Ma et al., Production and test of  
812 sPHENIX W/SciFiber electromagnetic calorimeter blocks in  
813 China. *NUCL SCI TECH.* **35**, 145 (2024). <https://doi.org/10.1007/s41365-024-01517-y>

814 [2] J.Y. Zhu, Y.Z. Su, H.B. Yang et al., Design and prototyping  
815 of the readout electronics for the transition radiation detector  
816 in the high energy cosmic radiation detection facility. *NUCL  
817 SCI TECH.* **35**, 82 (2024). <https://doi.org/10.1007/s41365-024-01446-w>

818 [3] J. Zhu, X.Y. Peng, S.Y. Luo, W.C. Xiao et al., Performance  
819 of the electromagnetic calorimeter module in the NICA-MPD  
820 based on Geant4. *NUCLEAR TECHNIQUES* **46**(12): 120202  
821 (2023).

822 [4] S. Acharya et al., Performance of the ALICE Electromagnetic  
823 Calorimeter. *JINST* **18** no.08, P08007 (2023). doi:  
824 10.1088/1748-0221/18/08/P08007.

825 [5] Rolf Lindner, LHCb Particle Identification Enhancement  
826 Technical Design Report. CERN, Technical Report No.  
827 CERN-LHCC-2023-005, LHCb-TDR-024, Geneva (2023).  
828 doi: 10.17181/CERN.LAZM.F5OH. <https://cds.cern.ch/record/2866493>

829 [6] T. Boettcher, Direct photon production at LHCb. *Nuclear Physics A* **982**, 251-254 (2019). doi:  
830 10.1016/j.nuclphysa.2018.10.046. <https://www.sciencedirect.com/science/article/pii/S0375947418303270>

831 [7] The LHCb Collaboration, LHCb Detector Performance. *International Journal of Modern Physics A* **30** (07), 1530022  
832 (2015). doi: 10.1142/S0217751X15300227. <https://doi.org/10.1142/S0217751X15300227>

833 [8] C. Abellán Beteta, A. Alfonso Albero, Y. Amhis et al., Cali-  
834 bration and performance of the LHCb calorimeters in Run 1  
835 and 2 at the LHC. 2020, Report Number: LHCb-DP-2020-001.  
836 <https://cds.cern.ch/record/2729028>

837 [9] The LHCb Collaboration, Observation of Photon Po-  
838 larization in the  $b \rightarrow s\gamma$  Transition. *Phys. Rev. Lett.* **112** (16), 161801 (2014). doi: 10.1103/Phys-  
839 RevLett.112.161801. <https://link.aps.org/doi/10.1103/PhysRevLett.112.161801>

840 [10] The LHCb Collaboration, First experimental study of pho-  
841 ton polarization in radiative  $B_s^0$  decays. *Physical review  
842 letters*, **118**(2), 021801. <https://doi.org/10.1103/PhysRevLett.118.021801>

843 [11] The LHCb Collaboration, Measurement of  $CP$  Vi-  
844 olation in the Decay  $B^+ \rightarrow K^+\pi^0$ . *Phys. Rev. Lett.* **126** (9), 091802 (2021). doi: 10.1103/Phys-  
845 RevLett.126.091802. <https://link.aps.org/doi/10.1103/PhysRevLett.126.091802>

846 [12] The LHCb Collaboration, Search for time-dependent  $CP$  vi-  
847 olation in  $D^0 \rightarrow \pi^+\pi^-\pi^0$  decays. *Phys. Rev. Lett.* **133**, 101803  
848 (2024). doi: 10.1103/PhysRevLett.133.101803.

849 [13] The LHCb Collaboration, Test of Lepton Universality with  
850  $B^0 \rightarrow K_s^0\ell^+\ell^-$  Decays. *Journal of High Energy Physics* **2017**, 55 (2017). doi: 10.1007/JHEP08(2017)055. [https://doi.org/10.1007/JHEP08\(2017\)055](https://doi.org/10.1007/JHEP08(2017)055)

851 [14] The LHCb Collaboration, Test of lepton universality in  $b \rightarrow$   
852  $s\ell^+\ell^-$  decays. *Phys. Rev. Lett.* **131**, 051803 (2023). doi:  
853 10.1103/PhysRevLett.131.051803.

854 [15] The LHCb Collaboration, Search for the  $B_s^0 \rightarrow \mu^+\mu^-\gamma$  decay.  
855 *JHEP* **2407**, 101 (2024). doi: 10.1007/JHEP07(2024)101.

856 [16] The LHCb Collaboration, Expression of Interest for a Phase-  
857 II LHCb Upgrade: Opportunities in flavour physics, and be-  
858 yond, in the HL-LHC era. CERN Technical Report, CERN-  
859 LHCC-2017-003, Geneva (2017). <https://cds.cern.ch/record/2244311>

860 [17] The LHCb Collaboration, Framework TDR for the LHCb  
861 Upgrade II: Opportunities in flavour physics, and beyond,  
862 in the HL-LHC era. CERN, Technical Report No. CERN-  
863 LHCC-2021-012, LHCb-TDR-023, Geneva (2021). <https://cds.cern.ch/record/2776420>

864 [18] The LHCb Collaboration, Physics case for an LHCb Upgrade  
865 II - Opportunities in flavour physics, and beyond, in the HL-  
866 LHC era. CERN, Technical Report No. LHCb-PUB-2018-  
867 009, CERN-LHCC-2018-027, LHCC-G-171, Geneva (2016).  
868 doi: 10.17181/CERN.QZRZ.R4S6. <https://cds.cern.ch/record/2636441>

869 [19] I. Eftymiopoulos et al., LHCb Upgrades and operation at  
870  $10^{34} \text{cm}^{-2} \text{s}^{-1}$  luminosity - A first study. (2018). <https://cds.cern.ch/record/2319258>

871 [20] L.M. Huhta, Physics program and performance of the AL-  
872 ICE Forward Calorimeter upgrade (FoCal). *Proceedings of  
873 the 31st International Workshop on Deep Inelastic Scattering  
874 (DIS2024)*. (2024). <https://cds.cern.ch/record/2910362>

875 [21] F. Orlandi, Upgrade of the CMS Barrel Electromagnetic  
876 Calorimeter for the LHC Phase-2. CERN, report number CMS-  
877 CR-2024-133, Geneva (2024). <https://cds.cern.ch/>

898 record/2908787

899 [22] The ATLAS Collaboration, Technical Design Report: A High- 900 Granularity Timing Detector for the ATLAS Phase-II Upgrade. 901 CERN, ATLAS-TDR-031, Geneva (2020). <https://cds.cern.ch/record/2719855>

902 [23] Q.Y. Shou, Y.G. Ma, S. Zhang, et al., Properties of QCD 903 matter: a review of selected results from ALICE experiment. 904 NUCL SCI TECH. 35, 219 (2024). <https://doi.org/10.1007/s41365-024-01583-2>

905 [24] J.H. Chen, X. Dong, X.H. He, et al., Properties of the QCD 906 matter: review of selected results from the relativistic heavy ion 907 collider beam energy scan (RHIC BES) program. NUCL SCI 908 TECH. 35, 214 (2024). <https://doi.org/10.1007/s41365-024-01591-2>

909 [25] M. Livan and R. Wigmans, Calorimetry for Collider Physics, 910 an Introduction, 1st ed. (2019). <http://lib.ugent.be/catalog/ebk01:4100000008707558>

911 [26] The CMS Collaboration, Performance of electron recon- 912 struction and selection with the CMS detector in proton- 913 proton collisions at  $\sqrt{s} = 8$  TeV. JINST, vol. 10, p. P06005, 914 2015. doi: 10.1088/1748-0221/10/06/P06005. <https://cds.cern.ch/record/1988091>

915 [27] The CMS Collaboration, Electron and photon reconstruction 916 and identification with the CMS experiment at the CERN LHC. 917 JINST, vol. 16, no. 05, p. P05014 (2021). doi:10.1088/1748- 918 0221/16/05/P05014. <https://cds.cern.ch/record/2747266>

919 [28] The CMS Collaboration, Performance of photon reconstruc- 920 tion and identification with the CMS detector in proton- 921 proton collisions at  $\sqrt{s} = 8$  TeV. JINST, vol. 10, p. P08010 922 (2015). doi: 10.1088/1748-0221/10/08/P08010. <https://cds.cern.ch/record/1988093>

923 [29] S. Nair, Simulation studies of  $\pi^0$ ,  $\eta$  and  $\omega$  meson reconstruc- 924 tion performance in pp collisions at  $\sqrt{s} = 14$  TeV in Forward 925 Calorimeter(FoCal). Indian Inst. Tech. Indore, 2023. <https://cds.cern.ch/record/2860262>

926 [30] Sergei Kholodenko, LHCb ECAL UII working group, 927 LHCb ECAL upgrade II. PoS PANIC2021, 100 (2022). 928 doi: 10.22323/1.380.0100. <https://cds.cern.ch/record/2836693>

929 [31] The LHCb Collaboration, LHCb Upgrade II Scoping 930 Document. CERN. CERN-LHCC-2024-010, LHCb-TDR- 931 026. Geneva. 2024. <https://cds.cern.ch/record/2903094>

932 [32] V. Breton, N. Brun, and P. Perret, A clustering algorithm for 933 the LHCb electromagnetic calorimeter using a cellular au- 934 tomaton. CERN. LHCb-2001-123. Geneva (2001). <https://cds.cern.ch/record/681262>

935 [33] O. Deschamps, F. P. Machefer, M. H. Schune, G. Pakhlova, 936 and I. Belyaev, Photon and neutral pion reconstruction. CERN- 937 LHCb-2003-091 (2003).

938 [34] C. Grupen and B. Shwartz, *Particle Detectors*, 2nd edition, 939 Cambridge Monographs on Particle Physics. Nuclear Physics 940 and Cosmology (Cambridge University Press, Cambridge, 941 2008).

942 [35] F. P. Machefer, P. Robbe, M. H. Schune, O. Deschamps, A. 943 Robert,  $B^0 \rightarrow \pi^+ \pi^- \pi^0$  reconstruction with the re-optimized 944 LHCb detector. CERN, Technical Report No. LHCb-2003- 945 077, Geneva (2003). <https://cds.cern.ch/record/691636>

946 [36] H. Terrier, I. Belyaev, Particle identification with LHCb 947 calorimeters. CERN (2003). url: <https://cds.cern.ch/record/691743>

948 [37] The LHCb Collaboration, The LHCb Detector at the 949 LHC. *Journal of Instrumentation* 3, S08005 (2008). doi: 950 10.1088/1748-0221/3/08/S08005. <https://dx.doi.org/10.1088/1748-0221/3/08/S08005>

951 [38] S. Barsuk, A. Golutvin, V. Kochetkov, I. Korolko, S. Malyshev, 952 V. Mayatski, V. Yu Rusinov, A. Soldatov, and E. Tarkovski, 953 Design and construction of electromagnetic calorimeter for 954 LHCb experiment. CERN Technical Report, LHCb-2000- 955 043, Geneva (2000). <https://cds.cern.ch/record/691508>

956 [39] The LHCb Collaboration, LHCb calorimeters: Technical 957 Design Report. CERN, Technical Design Report. LHCb, Geneva 958 (2000). <https://cds.cern.ch/record/494264>

959 [40] P. Jenni, P. Sonderegger, H. P. Paar, and R. Wigmans, The 960 high resolution spaghetti hadron calorimeter: proposal. CERN 961 Technical Report, NIKHEF-H-87-7, Geneva (1987). <https://cds.cern.ch/record/181281>

962 [41] L. An, E. Auffray, F. Betti et al., Performance of a spaghetti 963 calorimeter prototype with tungsten absorber and garnet 964 crystal fibres. *Nuclear Instruments and Methods in Physics 965 Research Section A: Accelerators, Spectrometers, Detectors 966 and Associated Equipment* **1045**, 167629 (2023), ISSN: 0168-9002. doi: 10.1016/j.nima.2022.167629. 967 <https://www.sciencedirect.com/science/article/pii/S0168900222009214>

968 [42] V. Alenkov, O. Buzanov, G. Dosovitskiy et al., Irradiation 969 studies of a multi-doped  $\text{Gd}_3\text{Al}_2\text{Ga}_3\text{O}_{12}$  scintillator. *Nucl. 970 Instrum. Methods Phys. Res. A* 916, 226-229 (2019). <https://doi.org/10.1016/j.nima.2018.11.101>

971 [43] K. Kamada et al., Composition Engineering in Cerium-Doped 972 ( $\text{Lu},\text{Gd})_3(\text{Ga},\text{Al})\text{SO}_{12}$  Single-Crystal Scintillators. *Crystal 973 Growth & Design*. vol. 11, no. 10, pp. 4484-4490 (2011). 974 doi: 10.1021/cg200694a. <https://doi.org/10.1021/cg200694a>

975 [44] M. Nikl et al., Defect Engineering in Ce-Doped Aluminum 976 Garnet Single Crystal Scintillators. *Crystal Growth & Design*. 977 vol. 14, no. 9, pp. 4827-4833 (2014). doi: 10.1021/cg501005s. 978 <https://doi.org/10.1021/cg501005s>

979 [45] M.T. Lucchini et al., Effect of  $\text{Mg}^{2+}$  ions co-doping on tim- 980 ing performance and radiation tolerance of Cerium doped 981  $\text{Gd}_3\text{Al}_2\text{Ga}_3\text{O}_{12}$  crystals. *Nuclear Instruments and Methods in 982 Physics Research Section A: Accelerators, Spectrometers, Detectors 983 and Associated Equipment*. vol. 816, pp. 176-183 (2016). 984 doi: 10.1016/j.nima.2016.02.004 <https://doi.org/10.1016/j.nima.2016.02.004>

985 [46] L. Martinazzoli et al., Scintillation properties and timing per- 986 formance of state-of-the-art  $\text{Gd}_3\text{Al}_2\text{Ga}_3\text{O}_{12}$  single crystals. *Nu- 987 clear Instruments and Methods in Physics Research Section A: 988 Accelerators, Spectrometers, Detectors and Associated Equipment*. 989 vol. 1000, pp. 165231 (2021). <https://doi.org/10.1016/j.nima.2021.165231>

990 [47] M. T. Lucchini, K. Pauwels, K. Blazek, S. Ochesanu, E. Auf- 991 fray, Radiation Tolerance of LuAG:Ce and YAG:Ce Crystals 992 Under High Levels of Gamma- and Proton-Irradiation. *IEEE 993 Transactions on Nuclear Science*. **63** (2), 586-590 (2016). doi: 994 10.1109/TNS.2015.2493347.

995 [48] M. Pizzichemi, L. Martinazzoli, Hybrid-MC. (2024). 996 <https://gitlab.cern.ch/spacal-rd/spacal-simulation>

997 [49] S. Agostinelli, J. Allison, K. Amako, et al., Geant4—a 998 simulation toolkit. *Nuclear Instruments and Methods in Physics 999 Research Section A: Accelerators, Spectrometers, Detectors 1000 and Associated Equipment*. **506** (3),

1024 250-303 (2003). doi: 10.1016/S0168-9002(03)01368-8. 1029  
1025 <https://www.sciencedirect.com/science/article/pii/S0168900203013688> 1030  
1026 1031  
1027 [50] The LHCb Collaboration, The LHCb Simulation Application, Gauss: Design, Evolution and Experience. Journal  
1028 of Physics: Conference Series. **331**, 032023 (2011). doi:  
10.1088/1742-6596/331/3/032023. url: <https://dx.doi.org/10.1088/1742-6596/331/3/032023>